

Project Development Phase
Model Performance Test

Date	9 November 2023
Team ID	592320
Project Name	Project - Identifying Airline Passenger Satisfaction using Machine Learning
Maximum Marks	10 Marks

Model Performance Testing:

All the performance testing of Machine Learning Model used for this project is listed below

S.No	Parameter	Values	Screenshot																																													
	Metrics	Classification Model: Confusion Matrix - , Accuracy Score- & Classification Report																																														
1	i)Decision Tree	Confusion Matrix: [[13573 820] [767 10636]] Accuracy Score: Training accuracy: 1.0 Test accuracy: 0.9389051432091161 Classification Report: <table><tr><td></td><td>0</td><td>1</td></tr><tr><td>Precision</td><td>0.95</td><td>0.93</td></tr><tr><td>Recall</td><td>0.94</td><td>0.93</td></tr><tr><td>F1-score</td><td>0.95</td><td>0.95</td></tr><tr><td>support</td><td>14573</td><td>11403</td></tr></table>		0	1	Precision	0.95	0.93	Recall	0.94	0.93	F1-score	0.95	0.95	support	14573	11403	<pre>#Decision Tree def dt(X_train,y_train,X_test,y_test): reg3 = DecisionTreeClassifier(criterion='entropy') reg3.fit(X_train,y_train) print('accuracy') print('Training accuracy= ',reg3.score(X_train,y_train)) print('test accuracy= ',reg3.score(X_test,y_test)) y_test_pred = reg3.predict(X_test) print('Test data confusion matrix: ') print(confusion_matrix(y_test,y_test_pred)) print('Test data classification report : ') print(classification_report(y_test,y_test_pred)) dt(x_train,y_train,x_test,y_test)</pre> <p>accuracy Training accuracy= 1.0 test accuracy= 0.9389051432091161 Test data confusion matrix: [[13753 820] [767 10636]] Test data classification report :</p> <table><tr><td></td><td>precision</td><td>recall</td><td>f1-score</td><td>support</td></tr><tr><td>0</td><td>0.95</td><td>0.94</td><td>0.95</td><td>14573</td></tr><tr><td>1</td><td>0.93</td><td>0.93</td><td>0.93</td><td>11403</td></tr><tr><td>accuracy</td><td></td><td></td><td>0.94</td><td>25976</td></tr><tr><td>macro avg</td><td>0.94</td><td>0.94</td><td>0.94</td><td>25976</td></tr><tr><td>weighted avg</td><td>0.94</td><td>0.94</td><td>0.94</td><td>25976</td></tr></table>		precision	recall	f1-score	support	0	0.95	0.94	0.95	14573	1	0.93	0.93	0.93	11403	accuracy			0.94	25976	macro avg	0.94	0.94	0.94	25976	weighted avg	0.94	0.94	0.94	25976
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	ii)Random Forest	Confusion Matrix: [[14240 333] [744 10659]] Accuracy Score: Training accuracy 0.9999903757314444 Test accuracy 0.9585386510625192 Classification Report: <table><tr><td></td><td>0</td><td>1</td></tr><tr><td>Precision</td><td>0.95</td><td>0.97</td></tr><tr><td>Recall</td><td>0.98</td><td>0.93</td></tr><tr><td>F1-score</td><td>0.96</td><td>0.95</td></tr><tr><td>support</td><td>14573</td><td>11403</td></tr></table>		0	1	Precision	0.95	0.97	Recall	0.98	0.93	F1-score	0.96	0.95	support	14573	11403	<pre>[] #Random Forest Model def RF(X_train,y_train,X_test,y_test): reg4 = RandomForestClassifier(criterion='entropy') reg4.fit(X_train, y_train) print('Accuracy:') print('Training accuracy = ',reg4.score(X_train,y_train)) print('Test accuracy =',reg4.score(X_test,y_test)) y_test_pred = reg4.predict(X_test) print('Test data confusion matrix') print(confusion_matrix(y_test,y_test_pred)) print('Accuracy Score:',accuracy_score(y_test,y_test_pred)) print('Test data classification report : ',classification_report(y_test,y_test_pred)) print('Predicting the data')</pre>																														
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	iii)KNN	<p>Confusion Matrix: [[12121 2452] [3617 7786]]</p> <p>Accuracy Score: Training Accuracy: 0.8497074222359101 Testing Accuracy: 0.7663612565445026</p> <p>Classification Report:</p> <table><thead><tr><th></th><th>0</th><th>1</th></tr></thead><tbody><tr><td>Precision</td><td>0.77</td><td>0.76</td></tr><tr><td>Recall</td><td>0.83</td><td>0.68</td></tr><tr><td>F1- score</td><td>0.80</td><td>0.72</td></tr><tr><td>support</td><td>14573</td><td>11403</td></tr></tbody></table>		0	1	Precision	0.77	0.76	Recall	0.83	0.68	F1- score	0.80	0.72	support	14573	11403	<pre>#KNN model def knn(X_train,y_train,X_test,y_test): reg = KNeighborsClassifier(n_neighbors=5) reg.fit(X_train,y_train) print('Accuracy') print('Training accuracy =',reg.score(X_train,y_train)) print('Test accuracy= ',reg.score(X_test,y_test)) y_test_pred = reg.predict(X_test) print('Test data confusion matrix: ') print(confusion_matrix(y_test,y_test_pred)) print('Test data classification_report :') print(classification_report(y_test,y_test_pred)) knn(x_train,y_train,x_test,y_test)</pre> <div>Accuracy Training accuracy = 0.8497074222359101 Test accuracy= 0.7663612565445026 Test data confusion matrix: [[12121 2452] [3617 7786]] Test data classification_report :<table><thead><tr><th></th><th></th><th>precision</th><th>recall</th><th>f1-score</th><th>support</th></tr></thead><tbody><tr><td></td><td>0</td><td>0.77</td><td>0.83</td><td>0.80</td><td>14573</td></tr><tr><td></td><td>1</td><td>0.76</td><td>0.68</td><td>0.72</td><td>11403</td></tr><tr><td></td><td>accuracy</td><td></td><td></td><td>0.77</td><td>25976</td></tr><tr><td></td><td>macro avg</td><td>0.77</td><td>0.76</td><td>0.76</td><td>25976</td></tr><tr><td></td><td>weighted avg</td><td>0.77</td><td>0.77</td><td>0.76</td><td>25976</td></tr></tbody></table></div>			precision	recall	f1-score	support		0	0.77	0.83	0.80	14573		1	0.76	0.68	0.72	11403		accuracy			0.77	25976		macro avg	0.77	0.76	0.76	25976		weighted avg	0.77	0.77	0.76	25976
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	iv)Logistic Regression	<p>Confusion Matrix: [[11662 2911] [2032 9371]]</p> <p>Accuracy Score: Training Accuracy: 0.8121342777948876 Testing Accuracy: 0.809708962118879</p> <p>Classification Report:</p> <table><thead><tr><th></th><th>0</th><th>1</th></tr></thead><tbody><tr><td>Precision</td><td>0.85</td><td>0.76</td></tr><tr><td>Recall</td><td>0.80</td><td>0.82</td></tr><tr><td>F1-score</td><td>0.83</td><td>0.79</td></tr><tr><td>Support</td><td>14573</td><td>11403</td></tr></tbody></table>		0	1	Precision	0.85	0.76	Recall	0.80	0.82	F1-score	0.83	0.79	Support	14573	11403	<pre>#Logistic Regression def lg(X_train,y_train,X_test,y_test): reg1 = LogisticRegression() reg1.fit(X_train,y_train) print('accuracy') print('Training accuracy= ',reg1.score(X_train,y_train)) print('Testing accuracy= ',reg1.score(X_test,y_test)) y_test_pred = reg1.predict(X_test) print('Test data confusion matrix:') print(confusion_matrix(y_test,y_test_pred)) print('Test data classification report: ') print(classification_report(y_test,y_test_pred))</pre>																																				
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OUT OF ALL THE MACHINE LEARNING MODEL ONLY THE RANDOM FOREST GIVES THE BEST PERFORMANCE (TRAINING AND TESTING ACCURACY IS GREATER THAN 95 %) SO RANDOM FOREST CLASSIFIER WILL BE USED FOR THIS PROJECT																																	
2	Tunning	Not Applied	Since our model is performing very well, there is no need for Tunning the model																														